

Surveillance of Surgery-related Adverse Events in Missouri Using ICD-9-CM Codes

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Abstract

Objectives: This study estimated the validity of 23 groups of codes in the International Classification of Diseases, 9th revision, Clinical Modification (ICD-9-CM or ICD), for flagging adverse events (AEs) related to hospital surgeries.

Methods: A set of ICD codes selected as “flags” for in-hospital AEs were developed with the assistance of a national expert panel. The codes were grouped into 66 AE classes, 23 of which were identified as potentially surgery-related. The predictive value positive (PVP) of the 23 classes was assessed by medical record review of 941 surgical discharges. **Results:** The 23 classes identified AEs associated with care management during the hospital stay with an average PVP of 45 percent. They identified AEs specifically related to surgery with a PVP of 37 percent. **Conclusions:** This exploratory study identified a small number of classes and individual ICD codes that identified surgery-related AEs. Further study of selected codes is needed to refine the classes and fully evaluate their use for statewide surveillance of surgery AEs.

Introduction

Identifying surgical adverse events using ICD-9-CM codes

International Classification of Diseases, 9th revision, Clinical Modification (ICD-9-CM or ICD) codes have been evaluated for a variety of purposes beyond documenting health conditions and procedures to support hospital billing. Uses have included characterizing the anatomical location of injury,¹ injury severity,^{2,3} disease severity,⁴ comorbidity severity,⁵ the likelihood of death,⁶ and the presence of medically caused injury.⁷⁻¹¹ The resulting severity scores, in turn, have largely been used to predict resource use¹² and to control for patient mix.¹³

ICD-coded hospital discharge data have also been used to assess quality of care. They are easily accessed through electronic databases and tend to be available in statewide repositories. Research on the use of hospital administrative data for evaluating quality of care has produced mixed results, depending on the purpose of the researcher. Efforts have been made to identify complications, complications due to medical care, complications due to errors in medical care, complications resulting in harm, preventable complications, process errors, and near misses.

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Studies of the validity of using ICD codes to identify adverse events (AEs) due to medical care have frequently involved the Complications Screening Program (CSP). ICD codes for identifying surgical AEs have been found to have some validity, while ICD codes identifying AEs in medical patients have been less successful.^{7, 10, 11, 14} The diagnosis and external-cause-of-injury codes (E-codes) specifically designated for recording misadventures and complications of surgical and medical care (996–999, E870–E879, E930–E949) have also been used to study the trends and patterns of AEs.¹⁵ Building on the CSP research, the Agency for Healthcare Research and Quality (AHRQ) recently introduced the Patient Safety Indicators (PSIs).¹⁶ The PSIs are primarily based on ICD codes for specific patient populations. They are intended to flag patient safety problems and point to areas for investigation and intervention. Zhan and Miller found they could be used to identify patients who are more likely to die, have longer lengths of stay, and have higher charges.⁹

In the study reported here, ICD codes representing diagnoses, procedures, and E-codes were evaluated for their ability to detect harm resulting from care management of surgical patients in acute care hospitals. No attempt was made to assess preventability, medical negligence, or error. The emphasis was on determining whether groups of ICD codes could be used for statewide surveillance of patient harm resulting from care during hospital stays.

This study is the result of a joint project between the Utah Department of Health (UDOH) and the Missouri Department of Health and Senior Services (MDHSS) under a cooperative agreement with AHRQ. The collaborative study addressed the accuracy and efficacy of using ICD codes, available in the mandated discharge data collection systems in both States, for surveillance and reporting on categories or classes of adverse events. UDOH evaluated ICD codes selected for their potential to identify adverse drug events (ADEs). For MDHSS, the focus was on AEs related to surgical hospital stays.

Methods

ICD-9-CM codes suggestive of surgical adverse events

An adverse event was considered to be an undesirable and unintended injury resulting from medical care management (an act of care provided by the hospital or the omission of necessary care, rather than from a patient's underlying disease process.) Harm was defined as death, prolonged hospital stay, or temporary or permanent impairment of bodily function or structure that requires intervention such as a change in monitoring of the patient's condition, a change in therapy, or active medical or surgical treatment or attention (if feasible or possible). Both harm and the degree to which the AEs were due to care management were operationalized by rating scales (Appendixes 2 and 3*) in the data collection tool.

* Appendixes cited in this report are available electronically at www.dhss.mo.gov/SurgeryAEs.

Surgery AEs were defined as harm events related to the preoperative care, the surgery, or the postoperative care.

To assist with refining the ICD-9-CM classification of AEs, the Utah/Missouri project team convened a national expert panel comprised of physicians, medical record coders, pharmacy directors, and health care researchers. An initial set of 1,192 ICD codes were selected for the study based on the UDOH report, *Adverse Events Related to Medical Care, Utah: 1995–99*, a review of the literature, and other research in progress on the use of ICD codes as flags of in-hospital AEs. Following an orientation session and consensus building on the definition of AEs for this study, each panelist reviewed a worksheet including a subset of the codes with a description of each code. Each code was rated by a minimum of three and a maximum of nine panelists along three scales: medical care/causality, patient harm, and preventability. A total of 1,003 were retained for the study. With consultation from some expert panelists, the UDOH medical epidemiologists grouped the final list of codes into 66 classes. Codes selected as flags for surgery-related AEs numbered 377 and made up 23 adverse event classes (Appendix 1).¹⁷ Additional details on the Utah/Missouri ICD-9-CM classification of adverse events, including the national panel exercise, will be addressed in a separate paper.

Sample design

Hospital discharge records for the first three quarters of 2001 formed the sampling frame for the study. Missouri hospitals and ambulatory surgery centers have been required by law to submit records to the MDHSS since 1993. Included on the records are patient identifiers, demographic information, up to 23 diagnoses and 20 procedures, type of admission, discharge disposition, and E-codes. In 2001 there were 123 general acute care hospitals accounting for 874,836 inpatient discharges.

A convenience sample of 40 hospitals was initially selected to provide data for this study and a second study designed to take advantage of the hospital license renewal surveys. Three of the 40 hospitals elected not to participate in the project, and a fourth was dropped due to scheduling problems with the licensure survey. The remaining 36 hospitals comprised the sampling frame for both studies. They tended to be somewhat larger and more urban than Missouri acute care hospitals as a whole. Forty-two percent had over 7,000 discharges (medical and surgical), compared to 32 percent of all 123 hospitals. Fifty-six percent of the 36 study hospitals were in Metropolitan Statistical Areas, compared to 49 percent of hospitals statewide.

Given the large number of codes selected for the AE classes, as well as constraints on the number of medical records that could be abstracted for this study, the sample design focused on representing the AE classes rather than individual codes or hospitals. It was initially estimated that approximately 1,000 surgical discharge records would allow a reasonable trade-off between an adequate statistical analysis of the 23 classes and a cost-manageable number of chart reviews. Records were sampled using the following criteria: First, only

records with a surgical Diagnostic Related Group (DRG) were included.¹⁸ Second, at least one of the flag codes had to be present in a secondary diagnosis field on the discharge record. (The principal diagnosis was assumed to represent a health condition existing at the time of admission and was not searched for flag codes.) Finally, the record was associated with a specific AE class based on the first flag code encountered when searching through the 22 secondary diagnosis and 20 procedure fields on the discharge record.

The sampling design was a doubly stratified random sample of the 23 AE classes. Each class was assigned to contribute a maximum of 30, 45, or 60 records, based on the number of records available for a class. Within each class, the hospitals were ranked according to the number of records that contained codes for that class. The hospitals were then divided among three roughly equal terciles—the top tercile containing hospitals with the most records for that class, the middle containing hospitals with a medium number of records, and the bottom tercile containing hospitals with the fewest records for the class. A hospital could be assigned to the top tercile in one class and the middle or bottom tercile in a different class. Each tercile was sampled proportionately to the percentage of records it contained for a class. Within these constraints, the records were selected randomly and without replacement. Hospitals having no records with a flag code in a given class were not sampled for that class. This double stratification design attempted to maximize the possibility that all classes and all strata, but not all hospitals, contributed records.

Due to chance factors, four hospitals did not contribute records, leaving 32 hospitals and 991 discharges in the final sample. Some attrition occurred during data collection due to factors such as unavailable charts, inadequate medical record documentation for the data abstraction, and errors in the specification of the record as an acute care discharge. At the conclusion of the chart review, 941 records representing 150 flag codes were available for analysis of the surgery AE classes.

Identifying surgical adverse events using medical record abstraction

The data collection tool was a computerized form adapted from Woloshynowych et al.¹⁹ The tool was preloaded with all diagnosis codes, E-codes, procedure codes, and other items taken from the selected discharge record. Abstractors recorded whether the identified injury or complication was an AE, whether it originated prior to or after the current admission, and whether it related to surgery. After documenting the AE, abstractors recorded that the AE was associated with one of the preloaded (billed) ICD codes or with an ICD code not contained in the discharge record, or that the AE was not adequately described by any existing ICD code. The form provided for documenting up to three confirmed adverse events and recording the relationship, if any, between the AEs and the preloaded diagnosis codes, E-codes, or procedure codes. To facilitate review, the chart abstraction tool contained the study definitions of adverse event and harm,

and required the reviewer to use scales to rate the level of harm (Appendix 2) and the degree to which the AE was due to care management (Appendix 3).

The medical chart review activity was conducted by Primaris, the Medicare quality improvement organization for the State of Missouri. Nurses experienced in medical record review were recruited to conduct the chart abstractions for the study. Qualifications of the nurse reviewers included 3 years of experience with clinical data abstraction in combination with either acute care or clinical coding experience.

The nurse reviewers were provided 40 hours of specialized training, focusing on adverse event identification, study definitions, record abstraction, ICD clinical coding, data collection tool completion, and data entry. A registered health information administrator provided the training on medical record coding and coding of adverse events. Special emphasis was placed on how and when to use E-codes.

Each nurse reviewer participated in a gold-standard testing process prior to field assignment for the project chart abstractions. Gold-standard test cases included one case in which no AE was documented and four cases that included one or more events that were consistent with the study definition of an AE. Only reviewers who passed the gold-standard test were retained for the project.

Analysis

A given AE could be associated with more than one ICD code on the hospital discharge record, and one or more of these codes could belong to the same class. If a record was sampled for a given class, and the record contained more than one code from that class, then each code in that class was validated (examined for its association with an AE). Each record was used to validate codes in only one class. The predictive value positive (PVP)²⁰ for a class was calculated as the percentage of codes in that class that were found to be associated with an AE.

Table 1 shows the 23 AE classes and the PVP of each class. The PVP: Post-admit AE column displays the percentage of flag codes in each class that were confirmed by chart review as referring to AEs that originated after the patient was admitted to the hospital. These patients were considered to have incurred a patient injury event (score of 1 or more on the Harm Rating Scale—Appendix 2) due to care management (score of 4 or higher on the Care Management Causation Rating Scale—Appendix 3), following admission to the hospital. The PVP: Surgery AE column shows the percentage of flag codes in each class that met the above criteria and were also judged to be related to the surgery, the preoperative care, or the postoperative care. The Pre-admit event column shows the percentages of flag codes that were not confirmed because the event to which they referred originated prior to the current admission. The No AE column shows the percentage of flag codes that referred to health conditions that failed to meet the study criteria for harm and care management causation. The percentages for each adverse event

class in the PVP: Post-admit AE, Pre-admit event, and No AE columns should sum to 100.

Table 1. ICD-9-CM code-identified adverse events confirmed by medical record abstraction

	Adverse event class number and label	Codes N	PVP: post-admit AE %	PVP: surgery AE %	Pre-admit event %	No AE %
1	Reopen surgical site	43	49	42	19	33
2	Control postprocedure hemorrhage	26	54	54	15	31
3	Perforation or laceration	27	56	52	15	30
4	Septicemia, bacteremia	41	22	05	15	63
5	Pneumonia	52	50	42	13	37
6	Other infections	59	32	19	20	47
7	Acute myocardial infarction	43	47	37	14	40
8	Pulmonary embolism & infection	27	48	44	04	48
9	Heart disease	24	50	38	04	46
10	Diseases of veins & lymphatics, circ. system	42	45	38	12	43
11	Diseases of respiratory system	61	52	39	08	39
12	Acute GI ulcer, bleed, other GI disorders	40	23	15	15	63
13	Postoperative GI disorders	27	37	37	19	44
14	Nausea, vomiting, diarrhea	59	53	46	07	41
15	Disorders of urinary system	38	32	18	08	61
16	Complications peculiar to specified procedures	44	34	30	14	52
17	Complications affecting specified body systems	59	64	61	03	32
18	Other complications of procedures	64	72	63	09	19
19	Complications of medical care, not elsewhere classified	26	58	27	08	35
20	Accidental cut, puncture, perforation or hemorrhage	68	78	69	01	21
21	Other misadventure of surgical and medical care	28	61	46	00	39
22	Surgery as cause of abnormal reaction or later complication, w/o mention of misadventure	56	55	52	07	38
23	Other procedures as cause of abnormal reaction or later complication, w/o mention of misadventure	58	48	38	09	43
	Total codes and average percent	1,012	49	40	10	41
	Total records	936				

Results

The 377 surgery-related codes are shown in Table 2 according to their classes. They are comprised of 30 procedure codes, 78 E-codes, and 269 diagnosis codes. ICD codes relating to complications and misadventures comprised the largest group of codes. Codes in the range of 996.00–999.99 accounted for 26 percent of the codes, followed by codes in the range of E871.0–E879.9, which accounted for 21 percent. Codes for digestive system diseases (520.00–579.99) were the next most frequent, accounting for 14 percent.

Table 2. The 23 AE classes and their ICD-9-CM codes

1	Reopening of surgical site 01.23, 03.02, 06.02, 34.03, 35.95, 39.49, 54.12, 54.61
2	Control of postprocedure hemorrhage 28.7, 39.41, 39.98, 49.95, 57.93, 60.94
3	Perforation or laceration 29.51, 31.61, 33.41, 33.43, 42.82, 44.61, 46.71, 46.75, 48.71, 50.61, 51.91, 55.81, 56.82, 57.81, 58.41, 69.41, 530.4, 569.83, 575.4, 576.3
4	Septicemia, bacteremia 038.0, 038.10, 038.11, 038.19, 038.3, 038.40 - 038.9, 790.7
5	Pneumonia 481, 482.0, 482.1, 482.2, 482.30, 482.31, 482.32, 482.39, 482.40, 482.41, 482.49, 482.81 - 482.84, 482.89, 482.9, 483.8, 485, 486
6	Other infections 008.45, 320.3, 320.82, 321.3, 421.0, 421.1, 421.9, 424.90, 424.91, 424.99, 510.0, 510.9, 513.0, 513.1, 519.01, 536.41, 569.61, 590.10, 590.11, 590.80, 590.9, 595.0, 595.9, 599.0, 670.00, 670.02, 670.04, 682.3, 682.4, 683, 958.3
7	Acute myocardial infarction 410.00, 410.01, 410.10, 410.11, 410.20, 410.21, 410.30, 410.31, 410.40, 410.41, 410.50, 410.51, 410.60, 410.61, 410.70, 410.71, 410.80, 410.81, 410.90, 410.91
8	Pulmonary embolism & infarction 415.11, 415.19
9	Heart disease 423.0, 427.5, 429.4
10	Diseases of veins & lymphatics, other diseases of circulatory system 451.11 - 451.9, 453.8, 458.2
11	Diseases of respiratory system 495.7, 507.0, 512.1, 514, 518.0, 518.4, 518.5, 518.81, 518.82, 519.02, 519.09, 519.1, 519.2
12	Acute GI ulcer, GI bleed, other GI disorders 530.82, 531.00 - 531.21, 532.00 - 532.21, 533.00 - 533.21, 534.00 - 534.21, 535.01, 535.11, 535.21, 535.41, 535.51, 535.61, 536.2, 536.3, 578.0 - 578.9

Table 2. The 23 AE classes and their ICD-9-CM codes, cont.

13	Postoperative GI disorders 536.40, 536.42, 536.49, 564.2, 564.3, 564.4, 569.60, 569.62, 569.69
14	Nausea, vomiting, diarrhea 787.01 - 787.03, 787.91
15	Disorders of urinary system 584.5 - 584.9, 598.2
16	Complications peculiar to specified procedures 996.00 - 996.99
17	Complications affecting specified body systems 997.00 - 997.02, 997.09, 997.1 - 997.5, 997.60 - 997.62, 997.69
18	Other complications of procedures 998.0, 998.11 - 998.13, 998.3, 998.51, 998.59, 998.6, 998.81 - 998.83, 998.89, 998.9
19	Complications of medical care, not elsewhere classified 999.0 - 999.9
20	Accidental cut, puncture, perforation or hemorrhage 998.2, E870.0 - E870.9
21	Other misadventure of surgical and medical care 998.4, 998.7, E871.0 - E876.9
22	Surgery operation/procedure as cause of abnormal reaction or later complications without mention of misadventures E878.0 - E878.9
23	Other procedures as cause of abnormal reaction or later complications without mention of misadventures E879.0 - E879.9

The codes that comprise the 23 classes differ substantially from AHRQ's Patient Safety Indicators (PSIs). Only 50 of the ICD codes used in the PSIs appear in the Utah/Missouri classification. Two of the PSIs, Postoperative Sepsis and Accidental Puncture and Laceration, are defined by the same ICD codes that make up Class 4 (Septicemia, Bacteremia) and Class 20 (Accidental Cut, Puncture, Perforation or Hemorrhage) in our system, although we did not restrict our sepsis definition to only those surgical discharges that were elective. Other codes common to the two systems do not define PSIs that are congruent with our classes. Rather, codes defining a PSI tend to be divided among two of our AE classes, or an AE class may contain most of the codes from a given PSI as well as codes not defining any PSI. Eight of the 20 PSIs are defined by ICD codes that are not present in any of our classes.

As Table 1 indicates, the 23 classes of codes had an average postadmission PVP rate of 49 percent. The average PVP for codes confirmed to be surgery-related was slightly lower at 40 percent. Codes failed to be confirmed largely

because they did not meet the harm or causation criteria and thus were judged not to be AEs. On average, 41 percent of the codes in the AE classes failed in this manner. Only 10 percent on average failed because the codes in the class were judged to refer to events that occurred prior to the current admission.

The best performing classes contained codes for complications (ICD codes 996–999). Class 20, Accidental Cut, Puncture, Perforation or Hemorrhage, had a postadmit PVP of 78 percent and a surgery PVP of 69 percent. (See Appendix 1 for the results for the individual codes that comprise each class.) As noted earlier, this class corresponds to the Accidental Puncture and Laceration PSI. Class 18, Other Complications of Procedures, had a postadmission PVP of 72 percent and a surgery PVP of 63 percent. The best performing class outside of those explicitly labeled as complications was Class 3, Perforation or Laceration; it had a postadmission PVP of 56 percent and a surgery PVP of 52 percent. Overall, the lowest PVP was for Class 4, Septicemia, Bacteremia, which had a postadmission PVP of 22 percent and a surgery PVP of only 5 percent. This class is defined by the same codes as the Postoperative Sepsis PSI, as mentioned earlier.

On the whole, the classes performed quite well with regard to identifying patient harm or injury originating after admission. Only 1 percent of codes in the best performing class (Class 20, Accidental Cut, Puncture, Perforation or Hemorrhage) flagged patient harm present at admission. None of the codes in Class 21, Other Misadventures of Surgical/Medical Care, flagged patient harm present at admission. The worst performers in this regard were Class 6, Other Infections; Class 13, Postoperative GI Disorders; and Class 1, Reopening of Surgical Site. Roughly one in five codes in these classes referred to patient harm present at admission.

Classes more often had low PVPs because their codes failed to be associated with confirmed AEs; these codes more likely reflected the patient's underlying condition or disease. Nearly two-thirds of the codes in Classes 4 (Septicemia, Bacteremia), 12 (Acute GI Ulcer, GI Bleeding), and 15 (Disorders of Urinary System) failed to be confirmed as referring to AEs.

PVP estimates for a large number of individual codes were unreliable because of their infrequency in the sample. For 36 codes, however, at least 10 charts had been reviewed to assess their PVPs. Seven of these had surgery PVPs of 67 percent or better. These were codes 34.03 (reopening of recent thoracotomy site), 458.2 (iatrogenic hypotension), 997.3 (respiratory complications), 998.11 (hemorrhage complicating a procedure), 998.12 (hematoma complicating a procedure), 998.2 (accidental puncture or laceration during a procedure), and E870.0 (accidental cut, puncture, perforation or hemorrhage during surgical operation). Many of the remaining codes appear promising but are based on too few records to make a judgment. These will be evaluated further in a second study.

Discussion

Comparison with other studies

Three studies have utilized the CSP to investigate the ability of groups of ICD codes to flag postadmission adverse events and substandard care in a large Medicare sample.^{10, 11, 14} The CSP uses trigger codes to assign patients to risk pools (major surgery, minor surgery, etc.) and to one of 28 complications (reopening of surgical site, postoperative acute myocardial infarction, etc.). A computer algorithm examines the diagnoses, procedures, and procedure dates to determine whether the record meets the criteria for a preventable, postadmission complication due to substandard care. Lawthers et al.¹⁰ studied the extent to which the CSP trigger codes were an accurate representation of the charts and whether they could identify patients with AEs that occurred after admission. Across 17 surgical complications, they found 73 percent confirmed as postadmission AEs. The rate for six medical complications was 32 percent. In a second study in this series, Weingart et al.¹⁴ examined how well the CSP identified complications of care and potential quality-of-care problems. They found a PVP rate of 68 percent for 15 surgical complications and 27 percent for 5 medical complications. Thirty-six percent of the flagged patients were found to have quality-of-care problems. In the third study, McCarthy et al.¹¹ looked at the extent to which complications identified in the CSP were supported by objective clinical evidence in the charts. For the 11 surgical complications studied, they found objective evidence in 69 percent of the charts. An additional 12 percent had only a physician's note, and 19 percent had neither. The medical complications had much lower confirmation rates.

Of these three studies, ours is most similar to the Weingart study. We looked at the ability of classes of ICD codes to flag patients who had AEs that were due to care management of the surgery patient during the current admission. We did not attempt to determine whether the care was substandard, as was done in the Weingart study.¹⁴ For 15 surgical complications, Weingart et al. found a postadmission rate PVP of 68 percent and a substandard-care rate of 36 percent. Our postadmission PVP for surgery AEs due to care management across 23 classes was 37 percent. However, our sample was not restricted to Medicare patients, a population that is likely more at risk for adverse events. Also, our study was exploratory in nature and we did not expect all the classes and codes to have high PVPs.

Lessons learned

Though an extensive number of codes were studied, only a few classes and individual ICD codes performed well enough to be used to flag surgery AEs in a statewide surveillance system. Adding diagnosis dates or readmission codes to hospital discharge records would only modestly improve the usefulness of this group of ICD codes for surveillance of AEs, but would help to eliminate false positives. Greater improvement for the codes studied here would result from adding a marker to indicate that a certain diagnosis was the result of care

management; however, there is no reason to believe such markers would be reported more reliably than are the E-codes for misadventures. Further study of which codes best identify which types of AEs in which populations, as is done with the PSIs, would be useful as we continue to determine how best to develop statewide surveillance of adverse events.

Limitations

Our results were not weighted to reflect the sampling scheme due to its complexity. Weighting might change the PVP percents somewhat, but probably not the relative performance of the classes. We also did not compute an interrater reliability coefficient. These have typically been modest in studies of this kind.^{21–23} The reviewers in this study were not physicians, but rather nurses who were carefully trained and tested prior to the study. While neither nurses nor physicians typically have expertise in clinical coding, it is possible that physician reviewers would have produced somewhat different results. A random sample of hospitals would have allowed firmer generalizations to the population than does our convenience sample, which slightly favored large, urban hospitals. Smaller hospitals do not have many surgical patients, however, so our results should not be overly unrepresentative in that respect.

Future directions

In order to build a more reliable ICD-based surveillance system for identifying adverse events, the second study in this series will focus on gaining a better understanding of which codes to include or exclude from the AE classes. Our study found inherent weaknesses in the validity of some of the defined AE classes, but also stand-alone strengths in particular ICD codes. Inspection of the classes with high PVPs found that the scores were driven by high PVPs of only one or two ICD codes in each class. Alternatively, some low-PVP classes appeared to contain one or two promising codes whose importance for surveillance purposes may have been masked by their low frequency in the sample.

Based on the results of this study, the followup study will focus more on the performance of individual codes within the AE classes. This strategy will facilitate the evaluation of the classes and the individual ICD codes for surveilling patient injury. Three classes (Heart Disease; Acute GI Ulcer, GI Bleeding, other GI Disorders; Disorders of Urinary System) have been dropped completely from the followup study. These classes did have a few codes specific to surgical complications, but the codes occurred very infrequently in the discharge population and would not be very useful for surveillance. These three classes also were among the more poorly performing classes, with PVPs less than 35 percent (Table 1).

Several of the ICD codes occurred with low frequency in our sample but are fairly frequent in the discharge population. Our followup study will attempt to obtain more reliable estimates of the validity of these codes by oversampling them. Conversely, those flag codes with adequate representation in this study will

not be included in the followup study. This method should help us to identify the best classes and codes and to assess the overall value of the classes for statewide surveillance of surgery AEs.

Conclusions

The 23 classes of ICD codes did only a fair job of flagging AEs related to surgery. While the codes tended to screen out harm events that originated prior to the hospitalization, they were less successful at identifying harm events that met our criteria for AEs related to care management. Two classes and a number of individual codes performed well enough to be used for statewide surveillance of surgery AEs. Some improvement in identifying surgery AEs may be gained by using the flag codes with high-risk populations, as is done with the PSIs. Further study is needed to refine the classes and to evaluate their use for statewide surveillance of surgery AEs.

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References

1. Barell V, Aharonson-Daniel L, Fingerhut LA, et al. An introduction to the Barell body region by nature of injury diagnosis matrix. *Inj Prev* 2002;8:91–6.
2. Mackenzie EJ, Steinwachs DM, Shankar B. Classifying trauma severity based on hospital discharge diagnoses. *Med Care* 1989;27(4):412–22.
3. Osler T, Rutledge R, Deis J, et al. ICISS: An international classification of disease-9 based injury severity score. *J Trauma* 1996;41(3):380–8.
4. Rutledge R, Osler T, Kromhout-Schiro S. Illness severity adjustment for outcomes analysis: validation of the ICISS methodology in all 821,455 patients hospitalized in North Carolina in 1996. Fifty-ninth Annual Meeting of the Society of University Surgeons; 1998 Feb 12–14; Milwaukee, WI. University of North Carolina at Chapel Hill, NC, Department of Surgery; 1998. pp. 187–95.
5. Schneeweiss S, Maclure M. Use of comorbidity scores for control of confounding in studies using administrative databases. *Int J Epidemiol* 2000 Oct;29(5):891–8.

6. Quan H, Parsons GA, Ghali WA. Validity of information on comorbidity derived from ICD-9-CM administrative data. *Med Care* 2002;40(8):675–85.
7. Geraci JM, Ashton CM, Kuykendall DH, et al. International classification of diseases, 9th revision, Clinical modification codes in discharge abstracts are poor measures of complication occurrence in medical inpatients. *Med Care* 1997;35(6):589–602.
8. Iezzoni LI, Davis RB, Palmer RH, et al. Does the complications screening program flag cases with process of care problems? Using explicit criteria to judge processes. *Int J Qual Health Care* 1999;11(2):107–18.
9. Zhan C, Miller MR. Excess length of stay, charges and mortality attributable to medical injuries during hospitalization. *JAMA* 2003 Oct 8;290(14):1868–74.
10. Lawthers AG, McCarthy EP, Davis RB, et al. Identification of in-hospital complications from claims data: is it valid? *Med Care* 2000;38(8):785–95.
11. McCarthy EP, Iezzoni LI, Davis RB, et al. Does clinical evidence support ICD-9-CM diagnosis coding of complications? *Med Care* 2000;38(8):868–76.
12. Rutledge R, Osler T. The ICD-9 based illness severity score: a new model that outperforms both DRG and APR-DRG as predictors of survival and resource utilization. *J Trauma* 1998;45(4):791–9.
13. Hartz AJ, Kuhn EM. Comparing hospitals that perform coronary artery bypass surgery: the effect of outcome measures and data sources. *Am J Public Health* 1994;84(10):1609–14.
14. Weingart SN, Iezzoni LI, Davis RB, et al. Use of administrative data to find substandard care: validation of the complications screening program. *Med Care* 2000;38(8):796–806.
15. Utah Health Data Committee. Adverse events related to medical care, Utah: 1995–1999. Salt Lake City, UT: Utah Department of Health; 2001.
16. Agency for Healthcare Research and Quality. Patient Safety Indicators, Version 2.1, Revision 1. Rockville, MD: Agency for Healthcare Research and Quality; March 2004. Available from: <http://www.qualityindicators.ahrq.gov>.
17. Hougland P, Masheter C, Xu W, Utah/Missouri Patient Safety Consortium. The 2002 report on the findings of rating the Utah/Missouri ICD-9-CM adverse event codes, Utah/Missouri Patient Safety Project. 2002. Available at <http://health.utah.gov/psi/pubs/Expertpanel.pdf>.
18. 3M Health Information Systems. Diagnosis related groups Version 18.0. Document Number 00-034 Rev. 00. Salt Lake City, UT: 3M Health Information Systems; 2001.
19. Woloshynowych M, Neale G, Vincent C. Case record review of adverse events: a new approach. *Qual Saf Health Care* 2003;12:411–5.
20. Centers for Disease Control. Guidelines for evaluating surveillance systems. *MMWR* 1988;37(suppl. no. S-5):1–17.
21. Geraci, JM. In-hospital complications occurrence as a screen for quality-of-care problems: what's next? *Med Care* 2002;38(8):777–80.
22. Layde PM, Maas LA, Teret SP, et al. Patient safety efforts should focus on medical injuries. *JAMA* 2002;287(15):1993–7.
23. Brennan TA. The institute of medicine report on medical errors—could it do harm? *N Engl J Med* 2002;342(15):1123–5.

